RESEARCH PAPER

Prediction of area burned under climatic change scenarios: A case study in the Great Xing'an Mountains boreal forest

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Abstract: Monthly projections of maximum temperature, relative humidity, precipitation, and wind speed were made based on the model of HadCM3 and the climatic change scenarios of IPCC SRES A2a and B2a for the future scenario periods of 2010-2039 (referred to as 2020s), 2040-2069(referred to as 2050s), and 2070-2099(referred to as 2080s). The period 1961-1990 was chosen as the baseline period. The observed and projected weather data were downscaled using delta change methods and historical relationships between weather data, area burned, and the seasonal severity rating (SSR) code of the Canadian Fire Weather Index System were examined. The variations of area burned as influenced by climate change were assessed quantitative and qualitative for the study region, assuming that the fire regimes had the similar responses to the warming climate as during the 20th century. Our results indicated that a linear regression relationship existing between the historical area burned and the mean SSR values with regression coefficient in the significant range of 0.16 to 0.61. It was evident that the increased SSR values could result in more area burned; the area burned in the study region would have an increasing pattern during the 21st century under scenarios A2a and B2a scenarios and the area burned would be doubled. Also, the future area burned would have a strong seasonal pattern that more fires would occur in summer and autumn fire season, especially in summer. The area burned in summer fire season would increase by 1.5 times compared to that in the baseline period in 2080s under A2a scenarios.

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Introduction

Fire is one of the dominant disturbances in China's boreal forest. Although China's forest cover has grown from approximately 12% to more than 20% through sustainable forest management over the past 30 years (He et al. 2007; He et al. 2008; Zhu. 2009), the forest area affected by fires increases continually at an alarmingly rate of 0.6 million hectares per year. Area burned can be strongly influenced by a complex set of variables, such as climate/weather, ignition, fuel and fire control activity, especially climate/weather (Flannigan et al. 1991; Wheaton.2001). Recently, the climate has been warming as a result of an increasing concentration of greenhouse gases and aerosols in the global atmosphere composition (Douville, 2002). The global average surface temperature has increased by 0.74°C during the last 100 years (IPCC et al. 2007). China's temperature rise has kept the same pace with global warming (Ding et al.2006). Such warming is likely to have a significant impact on area burned. It is suggested that the observed increase in area burned of China due to climate warming, for example, the average annual area burned of the total forest area increased from 0.5% in 1990-1999 to 0.8% in the period of 2000-2009. However, this warming has not been uniform across the whole country. Most of the warming in China over the last 50 years has been in the Northern Hemisphere upper latitudes, where the Great Xing'an Mountains boreal forest resides (Fang et al. 2000; Jia et al. 2009). The most productive forests area located in the Great Xing'an Mountains in northeastern China, unfortunately, this region is always associated with high forest fire danger rating. Hence, study on the future area burned trends in the Great Xing'an Mountains is important in advancing the understanding of the climate change on forest fire regimes of boreal ecosystem.

In recent years, there are a few methods available to estimate future area burned, and the use of the 21st century climate simulations of General Circulation Models (GCMs) and the historical



relationships between observed area burned and associated weather and fire weather index seems to be an appropriate methodology to apply (Flannigan et al. 2005; Tymstra et al. 2007; Carvalho et al. 2009; Krawchuk et al. 2009). For instance, Flannigan et al. (2005) estimated that area burned in Canada may increase by 74%-118% by the end of 21st century using historical relationships between weather/fire danger and area burned in tandem with two GCMs and these estimates do not explicitly take into account any changes in vegetation, ignitions, fire season length or human activity that may influence area burned. Tymstra et al. (2007) estimated the area burned based on the historical frequency of area burned using Canadian Forest Fire Weather Index (CFFWI) system class. Carvalho et al. (2008) performed regressions for the area burned and fire occurrence with the meteorological and FWI variables. Balshi et al. (2008) developed relationships between air temperature and fuel moisture codes derived from the CFFWI system to estimate annual area burned using Multivariate Adaptive Regression Spline approach across Alaska and Canada.

The objective of this study was to predict the area burned in Great Xing'an Mountains boreal forests by forest fire for the 21st century. To our knowledge, a number of the studies on future area burned as influenced by climate change are underway, however, nearly all these studies are conducted in North America, Europe and no previous studies have addressed this issue in China

Materials and methods

Study area

The study area covers approximately 8.35 million hectares of Great Xing'an Mountains, northeastern China (50°10′–53°33′ N, 121°12′–127°00′ E). The study region comprises three counties (Mohe, Tahe, Huma) and four districts (Jiagedaqi, Songling, Xinlin, Huzhong) (Fig.1). The region has a typical continental climate, with long, cold winters and short, cool summers. The mean annual temperature is -2.8°C and total annual precipitation is 746 mm. Elevation varies gradually from approximately 300 to 700 m. The dominant species in the region area are *Larix gmelini*, *Betula platyphylla*, *Pinus sylvestris* var. *mongolica*, *etc*. (Xu, 1998). It is observed that the species of higher dominance in the landscape area are more prone to wildfires.

Data collection

Forest fires data

Forest fire records were obtained from the local fire management agencies of the Great Xing'an Mountains. The fire records from 1966 to 2008 include the date of ignition, location, ignition cause, fire size. There are two fire seasons in this region: the spring fire season (15 May to 15 June) and the autumn fire season (15 September to 15 November). Forest fires occur throughout the fire seasons; however, recently they are becoming more frequent and burning large areas in summer months. Many studies have fo-

cused on forest fires in summer, and have considered the time period from 16 June to 14 September as the summer fire season (Zhang 2008; Zhang 2009; Zhang et al. 2010). In this paper, all fire records during the three fire seasons were included in the analysis for consistency with the meteorological records.



Fig. 1 Location and administrative division of Great Xing'an Mountains, northeastern China.

Meteorological data

The meteorological data for the study were obtained from China Meteorological Data Sharing Service System (http://cdc.cma.gov.cn/) for the same period as the fire data from 1966 through 2008. Eighteen meteorological stations were selected for analysis (see Table 1). For each station, the data contained daily maximum temperatures, 24–h precipitation, mean wind speed, and mean relative humidity. Not all the stations have equally complete meteorological records (Table 1). To fill these gaps, the stations with intermittent meteorological data were estimated by linear regression from the nearest stations.

Climatic scenarios

The climate change simulations produced by the third version of the UK Meteorological Office's Hadley Centre Coupled Model (HadCM3) were used to estimate the discharge of the study area. HadCM3 is the tool most commonly used to project future climate and exhibits better performance in East Asia. The model requires no artificial flux adjustments to prevent excessive climate drift and its dynamics and physics are solved on a 3.75°×2.5° longitude-latitude model grid with 19 hybrid vertical levels (Carson 1999 and Lynch 2008). The climate change scenarios were obtained from the Intergovernmental Panel on Climate Change (IPCC) Data Distribution Centre (http://www.ipcc-data.org/). Within the IPCC Special Report on Emission Scenarios (SRES), the SRES A2a and B2a scenarios were used in this analysis. Both A2a and B2a describe a "regionalization", meaning a heterogeneous world development. A2a describe a highly heterogeneous future world with regionally oriented economies. The B2a is also regionally oriented but with a general evolution towards environmental protection and social equity. Compared to A2a, B2a has a lower rate of population



growth, a smaller increase in GDP but more diverse technological changes and slower land-use changes (Nakicenovic et al. 2000; Leckebusch et al. 2004). The variables available for HadCM3 were expressed as 30-year monthly mean values, calculated for the baseline period 1961–1990 (refers to here as 1980s), and predicted fields for the 2010–2039 (refer to as 2020s), 2040–2069 (refer to as 2050s), and 2070–2099 (refers to as 2080s) (Arnell 2003). The climatic variables available for the two scenarios include mean maximum temperature, mean precipitation, wind speed and relative humidity.

Table 1. The information of meteorological stations used in the statistical analyses

Station name	Latitude	Longitude	Elevation(m)	Start year	Missing Year
Mohe	52.97	122.52	433.0	1957	1958
Tahe	52.35	124.72	361.9	1960	1962-1971
Xinlin	51.70	124.33	494.6	1972	
Huma	51.72	126.65	177.4	1954	
Amuer	52.83	123.18	550.0	1974	
Huzhong	52.05	123.67	520.8	1974	
Eergunayouqi	50.25	120.18	581.4	1957	
Tulihe	50.48	121.68	732.6	1957	
Daxinganling	50.40	124.12	371.7	1966	
Heihe	50.25	127.45	166.4	1959	
Xiaoergou	49.20	123.72	286.1	1957	
Nenjiang	49.17	125.23	242.2	1951	
Sunwu	49.43	127.35	234.5	1954	
Boketu	48.77	121.92	739.7	1951	
Zhalantun	48.00	122.73	306.5	1952	
Beian	48.28	126.52	269.7	1958	
Keshan	48.05	125.88	234.6	1951	
Fuyu	47.80	124.48	162.7	1956	

Statistical analyses

Delta change methods

Daily rather than monthly data were used because the weather and, consequently, fire behavior can change dramatically over time periods much shorter than a month. Downscaling methods were thus needed to bridge the gap between the large scale climate scenarios and the finer local climate scale and to change monthly climate variability into daily local climate variability. Delta change approach was used in this paper, which is very simple and has been used in many climate change impact studies (Lenderink et al. 2007; Zhao FF et al. 2007; Akhtar et al. 2008). The monthly climatic variables (temperature, humidity, precipitation and wind speed), obtained for the period 1980s and predicted mean monthly change fields for 2020s, 2050s, and 2080s for both A2a and B2a simulations, were downscaled by delta change approach for the regional model simulations. The four daily climatic variables for the future time series between the two simulations were computed according to the following equations:

$$T_{f,daily} = T_{o,daily} + \left(\overline{T_{f,monthly}} - \overline{T_{p,monthly}}\right) \tag{1}$$

$$P_{f,daily} = P_{o,daily} \frac{\overline{P_{f,monthly}}}{\overline{P_{p,monthly}}}$$
 (2)

$$R_{f,daily} = R_{o,daily} \frac{\overline{R_{f,monthly}}}{\overline{R_{p,monthly}}}$$
(3)

$$W_{f,daily} = W_{o,daily} \frac{\overline{W_{f,monthly}}}{\overline{W_{p,monthly}}}$$
(4)

Where, $T_{f,daily}$, $P_{f,daily}$, $R_{f,daily}$ and $W_{f,daily}$ are the future daily temperature (°C), precipitation(mm), relative humidity (%) and wind speed (m/s); $T_{o,daily}$, $P_{o,daily}$, $R_{o,daily}$ and $W_{o,daily}$ are the daily observations; $\overline{T_{f,monthly}}$, $\overline{P_{f,monthly}}$, $\overline{R_{f,monthly}}$ and $\overline{W_{f,monthly}}$ are the mean monthly HadCM3 simulated future temperature(°C), precipitation(mm), relative humidity(%) and wind speed(m/s); $\overline{T_{p,monthly}}$, $\overline{P_{p,monthly}}$, $\overline{R_{p,monthly}}$ are the mean monthly HadCM3 simulated present temperature(°C), precipitation(mm), relative humidity (%) and wind speed (m/s).

Forest fire weather index

The CFFWI system consists of six components: three fuel moisture codes (Fine Fuel Moisture code, Duff Moisture Code, Drought Code) and three fire behaviour indices (Initial Spread Index, Build Up Index, Fire Weather Index). The Fire Weather Index (FWI), a daily measure of potential fire danger, is derived from daily temperature, relative humidity, wind speed, and 24-h precipitation. The FWI is used to predict the intensity of a spreading fire, largely by estimating the state of forest fuels. The FWI is also used to estimate the fire hazard warning that is commonly posted in the Canadian northern communities. The Daily Severity Rating (DSR) is calculated from the FWI according to the following equation:

$$DSR = 0.0272(FWI)^{1.77}$$
 (5)

The purpose of the DSR is to weigh the FWI to improve estimates of the effort required to control a fire under different conditions. By averaging DSRs over a period, one can obtain the Seasonal Severity Rating (SSR). The SSR, a final component of CFFWI system (Van Wagner C E, 1987), was used to measure fire seasonal variation within the climate of the region in this study. The SSR was calculated as the mean seasonal Daily Severity Rating of all meteorological stations in the region over the fire season.

Results and discussion

Area burned trends

Historically fire has a strong impact on the vegetation in Great Xing'an Mountains. Current estimates indicated that an average



of 0.15 M ha was burned annually across the entire study region since 1966. Fires in 1966, 1972, 1977, 1987 and 2003 caused enormous damage to the area burned (more than 0.7 M ha). Although there is great year-to-year variability of average annual area burned, there is evidence that the area burned has decreased dramatically in recent decades as a result of strict enforcement of the fire suppression policy. The average area burned has decreased more than 80% since 1990. Analysis of average areas burned by decades revealed a bimodal distribution with distinct low and extreme high area burned years (see Fig.1). Statistical evidence suggested that there has been a decreasing trend in area burned starting in the early 1980–1989 period and continuing into the 1990–1999 period. The projected fire statistics showed an increase pattern from 2000 and onwards.

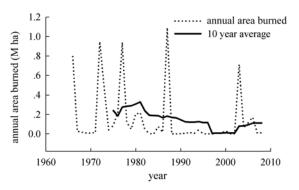


Fig. 1 Annual mean area burned in the period of 1966-2008 for Great Xing'an Mountains.

Based on the fire information provided, area burned in the study region is strongly seasonal, with 83.9% of area burned occurred in the spring fire season during 1966–2008. Also in the same period, a significant increase of area burned happened in the summer time. Since 2000, wildfires have burned approximately 35 520 ha in the summer fire season around this region, which are accounted for 36.7% of that since 1966. The monthly time span of area burned ranged from the beginning of March to the end of October (see Fig.2). On average, May is the month with the highest area burned.

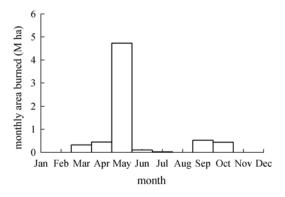


Fig. 2 Monthly mean area burned in the period of 1966-2008 for Great Xing'an Mountains.



Relationship between forest fires and fire weather indices

To examine the relationship between area burned and the mean seasonal SSR value for the period 1961–1990, Linear regression analyses were conducted between area burned and the SSR values with the latter as independent variable for the four fire seasons (Fig. 3: a is the whole fire season, b is the spring fire season, c is the summer fire season, d is the autumn fire season). It is found that good linear relationships exist between the two variables for the four fire seasons with regression coefficients ranging from 0.16 to 0.61. It is interesting to note the linear relationship between area burned and the SSR value for the autumn fire season is the strongest among the four fire seasons, with the regression coefficient 0.61 as the highest.

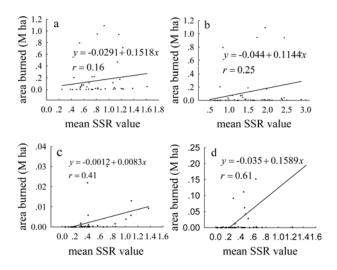


Fig. 3 The relationship between area burned and mean SSR values during 1961–1990 period (a: the whole fire season; b: spring fire season); c: summer fire season; d: autumn fire season).

Time series of SSR over the Chinese boreal forest

SSR was calculated for all eighteen meteorological stations, and these SSRs were interpolated to generate a SSR grid to cover the study region. Fig. 4 includes such interpolated grids for the mean 30-year SSR values under both A2a and B2a scenarios, respectively. The SSR values ranged from 0.01–1.20 across the study region, and obviously SSR values showed an increasing pattern in the future compared to the baseline period. The fastest increase in the mean 30-year SSR happens in the summer fire season, and the second fastest increase is in the autumn fire season.

Conclusion

In this study, we estimated the area burned in China's boreal forest for the 21st century. Our results indicate that area burned would increase in the study region with continuing global

warming, and the results are similar to those found in previous studies conducted in Canada, USA, Russia, and Portugal. A significant relationship was found between historical area burned and the mean SSR values in the study region, which can be illustrated by a simple linear regression with regression coefficient ranging from 0.16 to 0.61. Considerable evidences suggest that the increasing SSR value could translate into increasing area burned, and this finding is in accordance with that as found in Canada's boreal forest using two GCMs (Flannigan et al. 2005). According to the Hadcm3 model, the area burned would increase from 20% to 174 % across the most study region for the period 2010–2099 under both scenarios of A2a and B2a. Furthermore, area burned would peak in 2080s under both scenarios, and area

burned would increase by 20–174% under the A2a scenario and by 25–105% under the B2a scenario. The study region would experience 20–85% increase in area burned in the spring fire season under the A2a scenario, and 27–65% under the B2a scenario. However, the highest increase in area burned would appear in the summer fire season. The study region may experience an increase in area burned of 174% under A2a scenario and 106% under B2a scenario for 2080s. Alternatively, the region would face an increase of 22–174% in area burned in the spring fire season under the A2a scenario, and an increase of 25–106% under the B2a scenario. The results provided in this study may provide important information on how area burned is influenced by climatic changes for the fire management in the study region.

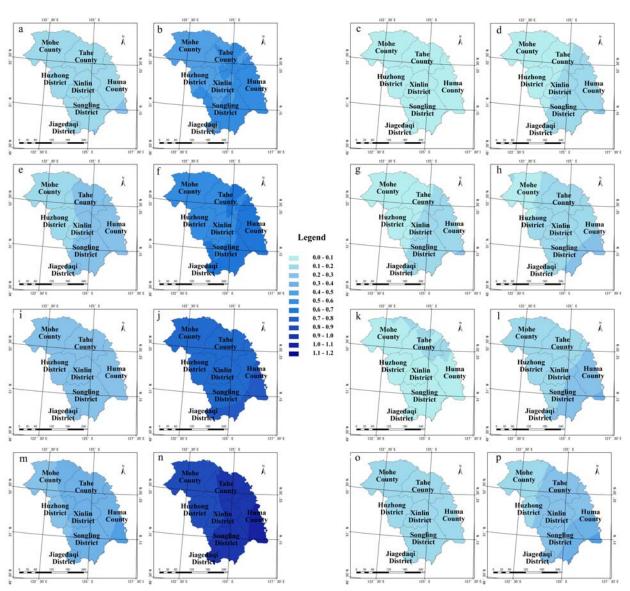


Fig. 4 Seasonal mean SSR (SMS) values for the baseline and the three future under A2a scenarios (a: the whole SMS for the baseline period; b: spring SMS for the baseline period; c: summer SMS for the baseline period; d: autumn SMS for the baseline period; e: the whole SMS for 2020s; f: spring SMS for 2020s; g: summer SMS for the 2020s; h: autumn SMS for the 2020s; i: the whole SMS for 2050s; j: spring SMS for 2050s; k: summer SMS for the 2050s; l: autumn SMS for the 2050s; n: spring SMS for 2080s; o: summer SMS for the 2080s; p: autumn SMS for the 2080s).



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